

**A NEW AUDITING MECHANISM FOR OPEN SOURCE
NOSQL DATABASE – A CASE STUDY ON OPEN
SOURCE MONGODB DATABASE**

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Abstrak

MongoDB adalah satu contoh sistem pengurusan pangkalan data NoSQL yang agak baru di pasaran pangkalan data dan ia digunakan dalam banyak projek penting dan produk. Analisis Keselamatan untuk MongoDB mendedahkan bahawa ia tidak memberikan apa-apa kemudahan untuk tindakan audit dilakukan dalam pangkalan data. Baru-baru ini, syarikat MongoDB cuba untuk membetulkan jurang pengauditan dengan menyediakan MongoDB perusahaan baru versi 2.6 (8 April 2014). Sistem pengauditan boleh merakam operasi berikut: skema (DDL), set replika, pengesahan dan kebenaran, dan operasi umum. Tetapi malangnya ia masih tidak boleh merakam Data Manipulasi Bahasa (DML). Oleh itu, kajian ini bertujuan untuk meningkatkan fungsi pengauditan di MongoDB dengan membentangkan satu mekanisme baru bagi pengauditan pangkalan data NoSQL MongoDB untuk memasukkan Data Manipulasi Bahasa (DML) / CRUD (Membuat, Baca, Kemaskini dan memadam) operasi.

Kata Kunci: data big, NoSQL, MongoDB, MongoDB pengauditan

Abstract

MongoDB as a NoSQL database management system is relatively new on the database market and it is used in many important projects and products. Security analysis for MongoDB revealed that it doesn't provide any facilities for auditing actions performed in the database. Recently, MongoDB company tried to rectify the auditing gap by providing MongoDB new enterprise version 2.6 (8th of April 2014). The auditing system logs operations information including; schema data definition language operations and operations related to replica set in addition to operations of authentication and authorization, and eventually general operations. But unfortunately still cannot record Data Manipulation Language (DML). Thus, this study aims to improve the auditing functionality in MongoDB by presenting a new mechanism for auditing NoSQL MongoDB database to include Data Manipulation Language (DML)/ CRUD (Create, Read, Update and delete) operations.

Keywords: Big data, NoSQL, MongoDB, MongoDB auditing

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“This Thesis is only the beginning of my journey.”

HANY HEIDAR HUSSEIN MOHAMED

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List of Abbreviations

ACID	Atomicity, Consistency, Isolation, Durability
BSON	Binary JavaScript Object Notation
CRUD	Create Read Update Delete
DDL	Data Definition Language
DML	Data Manipulation Language
DBA	Database Administrators
JSON	JavaScript Object Notation
NoSQL	Not Only SQL
RBAC	Role Based Access Control
RDMS	Relational Database Management System
RFID	Radio Frequency Identification
RPC	Remote Procedure Call
OS	Operating System

SQL Structured Query Language

TCP/IP Transmission Control Protocol /Internet Protocol

CHAPTER ONE

INTRODUCTION

1.1 Background

The term NoSQL is used first time by Mr. Carlo Strozzi (1998) to name his lightweight open source relational database. The system did not expose the standard SQL (Structure Query Language) interface. There is a series of database following NoSQL (Not Only SQL) standards. The term “Not Only SQL” is also used for these databases that provide storage and retrieval mechanism with less constrained consistency models than traditional relational databases (Mohamed, Altrafi, & Ismail, 2014).

The last three decades were ruled by the traditional relational database management systems such as DB2, MS SQL Server and Oracle (Bonnet, Laurent, Sala, Laurent, & Sicard, 2011). They have the standard SQL. Due to the growing web scale applications such as Facebook, mobile applications and RFID (Radio Frequency Identification) the Internet has become an essential part of the world today.

Everyday zettabytes of data are being generated due to these applications. Due to changing need of applications and databases, the traditional relational databases are proved to be weak in distributed environment. This made NoSQL databases to get importance and preference. Being schema free, elastic and scalable, NoSQL databases appeared to be effective(Kanade, Gopal, & Kanade, 2013).

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